# BRDF Analysis of Savanna Vegetation and Salt-Pan Samples

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Abstract—In this paper, laboratory-based bidirectional re-5 flectance distribution-function (BRDF) analysis of vegetation 6 leaves, soil, and leaf-litter samples is presented. The leaf litter 7 and soil samples, numbered 1 and 2, were obtained from a site 8 located in the savanna biome of South Africa (Skukuza: 25.0° S, 9 31.5° E). A third soil sample, number 3, was obtained from Etosha 10 Pan, Namibia (19.20° S, 15.93° E, altitude of 1100 m). In addition, 11 BRDF of local fresh and dry leaves from tulip tree (Liriodendron 12 tulipifera) and black locust tree (Robinia pseudoacacia) were stud-13 ied. It is shown how the BRDF depends on the incident and scatter 14 angles, sample size (i.e., crushed versus whole leaf), soil samples 15 fraction size, sample status (i.e., fresh versus dry leaves), vegeta-16 tion species (poplar versus locust), and vegetation's biochemical 17 composition. As a demonstration of the application of the results of 18 this paper, airborne BRDF measurements acquired with NASA's 19 cloud absorption radiometer over the same general site where 20 the soil and leaf-litter samples were obtained are compared to 21 the laboratory results. Good agreement between laboratory and 22 airborne-measured BRDF is reported.

23 *Index Terms*—Bidirectional reflectance distribution function 24 (BRDF), metrology, optical instrumentation and measurements, 25 remote sensing, vegetation.

# 26 I. Introduction

THE MONITORING of land surface is a major science objective in Earth remote sensing. A major goal in land premote sensing is to identify major biomes and to map and distinguish the changes in their composition introduced by anthropogenic and climatic factors. Currently, deforestation and desertification are the most important land-cover-area processes of scientific interest. These processes play a major role in climate variation particularly with respect to clouds and rainfall. Understanding the view-angle characteristics of the properties of biomes will help in predicting the changes in major Earth biomes and their impact on climate variation and, hence, lead to formulation of better site-specific management plans.

The bidirectional reflectance distribution function (BRDF) 40 describes the reflectance of optical materials as a function of

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incident and scatter angles and wavelength. It is used in modern 41 optical engineering to characterize the spectral and geometrical 42 optical scatter of both diffuse and specular samples. The BRDF 43 is particularly important in the characterization of reflective 44 and transmissive diffusers used in the preflight and on-orbit 45 radiance and reflectance calibration of Earth remote-sensing 46 instruments [1]. Satellite BRDF measurements of Earth scenes 47 can be used as a sensitive tool for early detection of changes 48 occurring in vegetation canopies, soils, or the oceans [2]. For 49 example, water-content changes in soil and vegetation can be 50 detected and monitored using BRDF.

In this paper, we analyzed laboratory-based BRDF data of 52 vegetation leaves, leaf litter, and soil samples to study, on a 53 small scale, the effects of view-angle distribution and spectral 54 variability in the reflectance of natural biome samples. The 55 samples measured in the laboratory included leaf litter, pre- 56 dominantly from acacia trees, and two different composition 57 regolith soils collected from the savanna biome of Skukuza, 58 South Africa [Fig. 1(a)]. A third soil sample was collected 59 from Etosha Pan, Namibia [Fig. 1(b)]. In addition, BRDF of 60 fresh and dry leaves from the tulip poplar tree (Liriodendron 61 tulipifera), poplar hereinafter, and black locust tree (Robinia 62 pseudoacacia) located in Maryland, U.S., were studied. The 63 laboratory-based BRDF of all samples was analyzed in the 64 principal plane at 340, 470, and 870 nm, at incident angles 65 of 0° and 67°, and at viewing angles from 0° to 80° for all 66 samples, except the sample from Etosha Pan. The latter has 67 been measured at 412, 555, 667, and 869 nm and at incident 68 angles of 0°, 30°, and 60°. BRDF dependence on the sample 69 particle size was investigated by measuring the following three 70 different samples: whole leaves, samples with leaf particle sizes 71 between 4 and 4.75 mm, and samples with leaf particle size 72 between 1.7 and 2 mm. All the BRDF values were measured 73 using NASA Goddard Space Flight Center (GSFC)'s Diffuser 74 Calibration Laboratory (DCL) scatterometer [cf. Fig. 2(a) and 75 (b)]. The typical measurement uncertainty was 1% (k = 1) or 76better, where k is the coverage factor. The results presented are 77 traceable to the National Institute of Standards and Technol-78 ogy's special trifunction automated reference reflectometer.

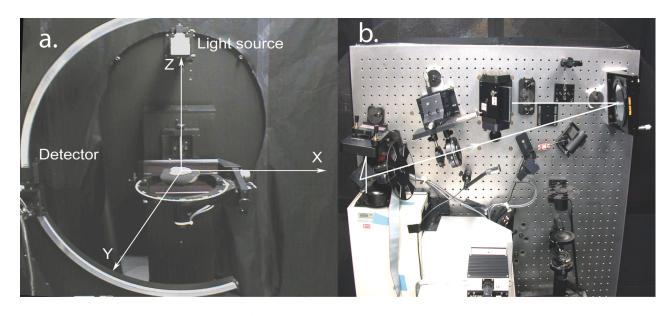
The DCL has participated in several round-robin measure- 80 ment campaigns with domestic and foreign calibration in- 81 stitutions in support of Earth and space satellite validation 82 programs [3]. The facility has characterized many types of 83 diffusely reflecting samples including Spectralon [4], aluminum 84 diffusers, barium sulfate, radiometric tarps [5], and Martian 85 regolith simulant [6].

The laboratory results were compared to BRDF measure- 87 ments with an airborne radiometer, cloud absorption radiometer 88





Fig. 1. (a) Skukuza. (b) Etosha Pan.



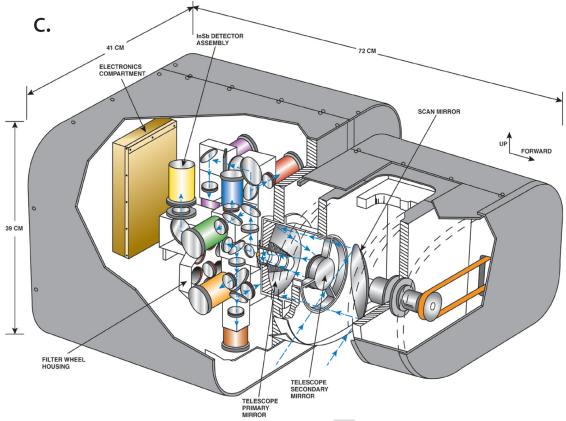


Fig. 2. (a) Scatterometer goniometer. (b) Scatterometer optical setup. (c) CAR instrument.

89 (CAR), which was developed at GSFC [cf. Fig. 2(c)] and 90 described by King *et al.* [7]. The CAR is designed to scan 91 from 5° before zenith to 5° past nadir, corresponding to a total 92 scan range of 190°. Each scan of the instrument lies across 93 the line that defines the aircraft track and extends up to 95° 94 on either side of the aircraft horizon. The CAR field of view 95 (FOV) is 17.5 mrad (1°), the scan rate is 1.67 Hz, the data 96 system has nine channels at 16 b, and it has 382 pixels in 97 each scan line. CAR's 14 channels are located between 335 and 98 2344 nm. The CAR channels' exact wavelengths and bandpass

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widths are shown in Table I. These bands were selected to 99 avoid atmospheric molecular-absorption bands in the near- 100 and shortwave-infrared. In the normal mode of operation, data 101 are sampled simultaneously and continuously on nine individ- 102 ual detectors. The first eight data channels between 335 and 103 1296 nm are always simultaneously and continuously sampled 104 on eight individual detectors, while the ninth data channel is 105 registered for signal selected from the six remaining channels 106 on a filter wheel between 1530 and 2344 nm. The filter wheel 107 can either cycle through all six wavelengths at a prescribed 108

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8 Continuously Sampled Channels		6 Filter Wheel Channels	
Spectral Channel	Wavelength (FWHM) (nm)	Spectral Channel	Wavelength (FWHM) (nm)
1	340 (9)	9	1556 (32)
2	381 (6)	10	1656 (45)
3	472 (21)	11	1737 (40)
4	682 (22)	12	2103 (44)
5	870 (22)	13	2205 (42)
6	1036 (22)	14	2302 (43)
7	1219 (22)		
8	1273 (23)		

TABLE I CAR SPECTRAL CHANNELS

109 interval, usually changing filters every fifth scan line or lock 110 onto any one of them, mostly 1656, 2103, or 2205 nm, and 111 sample it continuously. Data are collected through the 190° 112 aperture that allows observations of the earth–atmosphere scene 113 around the starboard horizon from local zenith to nadir while 114 the CAR scan mirror rotates 360° in a plane perpendicular to 115 the direction of flight.

In this paper, the CAR data were obtained over Skukuza, 117 South Africa, (25.0° S, 31.5° E) and Etosha Pan, Namibia 118 (19.20° S, 15.93° E), which are core sites for validation of the 119 Earth Observing System Terra and Aqua satellite instruments. 120 These BRDF measurements are reported by Gatebe *et al.* [8]. A 121 distinct backscattering peak in the principal plane characterizes 122 the BRDF over Skukuza, whereas the BRDF over Etosha Pan 123 is more enhanced in the backscattering plane and shows little 124 directional variation.

### II. METHODOLOGY

126 The definition and derivation of BRDF are credited to 127 Nicodemus et~al.~[9], who presented a unified approach to 128 the specification of reflectance in terms of both incident and 129 reflected light-beam geometries for characterizing both diffuse 130 and specular reflecting surfaces of optical materials. He defined 131 the BRDF as a distribution function relating the irradiance 132 incident from one given direction to the reflected radiance in 133 another direction. Thus, the BRDF is presented in radiometric 134 terms as the ratio of the radiance  $L_r$  reflected by a surface into 135 the direction  $(\theta_r,\phi_r)$  to the incident irradiance  $E_i$  on a unit 136 surface area from a specified direction  $(\theta_i,\phi_i)$  at a particular 137 wavelength  $\lambda$  expressed mathematically as

$$BRDF = \frac{dL_r(\theta_i, \phi_i, \theta_r, \phi_r; E_i)}{dE_i(\theta_i, \phi_i)} \tag{1}$$

138 where the subscripts i and r denote incident and reflected light, 139 respectively,  $\theta$  is the zenith angle, and  $\phi$  is the azimuthal angle. 140 The BRDF units are  ${\rm sr}^{-1}$ .

Nicodemus *et al.* further assumed that the incident beam 142 has uniform cross section, the illumination on the sample is 143 isotropic, and all scattering comes from the sample surface and 144 none from the bulk. The bidirectional reflectance corresponds to

directional-directional reflectance and ideally means that both 145 incident and reflected light beams are collimated. Although per- 146 fect collimation and diffuseness are rarely achieved in practice, 147 they can be used as a very useful approximation for reflectance 148 measurements. In practice, we deal with real sample surfaces 149 that reflect light anisotropically, and the optical beams used to 150 measure the reflectance are not perfectly uniform. Hence, from 151 a practical consideration, Stover [10] presented the BRDF in 152 a convenient form for measurement applications. The BRDF 153 is defined in radiometric terms as reflected surface radiance 154 in a given direction divided by the incident surface irradiance 155 from another or the same (i.e., retro) direction. The incident 156 irradiance is the radiant flux incident on the surface. The 157 reflected surface radiance is the light flux reflected through solid 158 angle  $\Omega$  per projected solid angle 159

$$BRDF = \frac{\frac{P_r}{\Omega}}{P_i \cos \theta_r} \tag{2}$$

where  $P_r$  is the reflected radiant power and  $\Omega$  is the solid angle 160 determined by the area of detector aperture A and the radius 161 from the sample to the detector R. The solid angle can be 162 computed as  $\Omega = A/R^2$ .  $P_i$  is the incident radiant power, and 163  $\theta_r$  is the reflected zenith angle. The  $\cos\theta_r$  factor is a correction 164 to account for the illuminated area, when viewed from the 165 detector direction. BRDF has units of inverse steradians and 166 can range from very small numbers (e.g., off-specular black 167 samples) to very large values (e.g., highly reflective samples 168 at specular reflectance). Following Stover's concept, the BRDF 169 defining geometry is shown in Fig. 3(a), where the subscripts 170 i and r refer to incident and reflected quantities, respectively. 171 Note that the BRDF is often called cosine corrected, when the 172  $\cos\theta_r$  factor is not included.

In the case of CAR measurements, the spectral BRDF  $(R_{\lambda})$  174 is expressed following van de Hulst [11] formulation [see also 175 Fig. 3(b)]:

$$R_{\lambda}(\theta, \theta_0, \Phi) = \frac{\pi I_{\lambda}(\theta, \theta_0, \Phi)}{\mu_0 F_{\lambda}}$$
 (3)

where  $I_{\lambda}$  is the measured reflected intensity (radiance),  $F_{\lambda}$  177 is the solar flux density (irradiance) incident on the top of 178 the atmosphere,  $\theta$  and  $\theta_0$  are, respectively, the viewing and 179

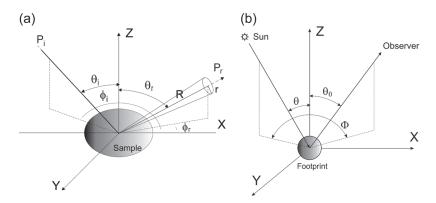


Fig. 3. Angular conventions. (a) BRDF. (b) BRF.

180 incident zenith angles,  $\Phi$  is the azimuthal angle between the 181 viewing and incident light directions, and  $\mu_0 = \cos\theta_0$ . The  $R_\lambda$  182 is equivalent to bidirectional reflectance factor (BRF) as defined 183 by Nicodemus *et al.*, which is dimensionless and numerically 184 equivalent to BRDF times  $\pi$ .

The DCL scatterometer was used to measure the BRDF 186 at different wavelengths and at different source and detector 187 angular configurations. Although a more detailed design review 188 on the scatterometer is published by Schiff et al. [12], we in-189 clude in this paper some basic information. The scatterometer is 190 located in a class 10 000 laminar-flow cleanroom. It is capable 191 of measuring the BRDF and bidirectional transmission distri-192 bution function of a wide range of samples, including white-193 and gray-scale diffusers, black painted or anodized diffusers, 194 polished or roughened metal surfaces, clean or contaminated 195 mirrors, transmissive diffusers, liquids, and granular solids. The 196 operational spectral range of the instrument is from 230 to 197 900 nm. The scatterometer can perform in the principal plane 198 and out of the principal plane BRDF measurements. It consists 199 of a vertical optical source table, a sample stage, a detector 200 goniometer, and a computer system for positioning control, data 201 collection, and analysis.

The optical table can be rotated around its horizontal axis 203 located at the table center to change the incident angle  $\theta_i$ 204 relative to the sample normal [cf. Fig. 2(b)]. The optical source 205 table contains two light sources—a 75-W xenon short-arc lamp 206 coupled to a Chromex 250SM scanning monochromator and a 207 replaceable coherent source in the operational spectral range. 208 The scattered light from the sample is collected using an 209 ultraviolet-enhanced silicon photodiode detector with output 210 fed to a computer-controlled lock-in amplifier. The sample is 211 mounted on a sample stage in the horizontal plane. The sample 212 stage allows proper positioning of the sample with respect to the 213 incident beam. It can be moved in X, Y, and Z linear directions 214 using three motors. The sample stage provides sample rotation 215 in the horizontal plane around the Z-axis, thereby enabling 216 changes in the incident azimuthal angle  $\phi_i$ . The standard scat-217 terometer sample stage can accommodate samples as large as 218 45 cm<sup>2</sup> and up to 4.5 kg in weight. However, larger samples 219 have been measured using custom-designed sample adapters. 220 As shown in Fig. 2(a), the detector assembly moves along the 221 arc, providing the ability to make reflectance measurements as 222 a function of the viewing zenith angle  $\theta_r$ . The arc rotates 180° 223 around the vertical Z-axis which determines the viewing azimuthal angle  $\phi_r$ . The center of the illuminated spot on the sur- 224 face of the sample has to be positioned at the cross point of the 225 three perpendicular goniometer rotation axes, X,Y,Z, coincid- 226 ing with the center of a sphere with radius equal to the distance 227 between that point and the detector assembly's cover aperture. 228

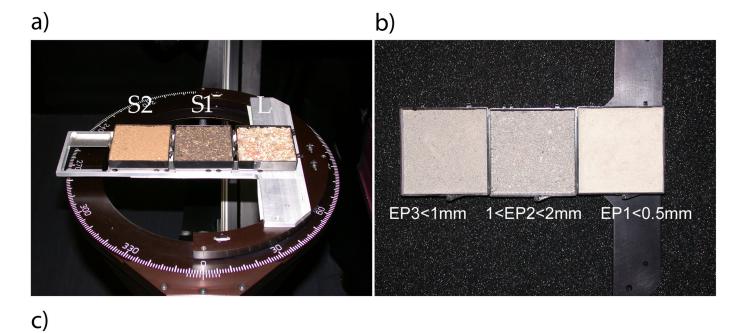
The illuminated area on the sample underfills the FOV of 229 the measurement detector. All measurements in this paper were 230 made for polarizations of the incident beam parallel P and 231 perpendicular S to the plane of incidence. The BRDF for each 232 polarization was calculated by dividing the net signal from the 233 reflected radiant flux by the incident flux and the projected solid 234 angle from the calibration item to the limiting aperture of the 235 detector. The BRDF values for both polarizations were then 236 averaged to yield the BRDF for unpolarized incident radiant 237 flux, and the values of the unpolarized scattering case are 238 reported in this paper. The operation of the scatterometer is 239 fully computerized. Customized software controls all motion, 240 data acquisition, and data analysis.

# III. MEASUREMENTS 242

For the study described in this paper, we studied vegetative 243 and soil samples from three different locations. The first loca- 244 tion was Skukuza, South Africa; the second was Etosha Pan, 245 Namibia; and the third was Maryland, U.S. 246

Skukuza [see Fig. 1(a)] is a well-foliaged rest camp on the 247 southern banks of Sabie River in southern Kruger National 248 Park. The site exhibits typical savanna-ecosystem characteris- 249 tics: more or less continuous vegetation cover with trees and 250 shrubs in varying proportions. The differences in the composi- 251 tion, structure, and density of plant communities are attributable 252 to the influence of the moisture in the area, as well as differ- 253 ences in the terrain: altitude and slope, as well as soil type 254 and the prevalence of fires. The environment and vegetation 255 of the flux measurement site near Skukuza is best described 256 by Scholes et al. [13] and Pinheiro et al. [14]. The vegetation 257 is dominated by savanna grass and knob thorn trees (Acacia 258 nigrescens) with their flat relatively narrow crown and sparse 259 canopy. They grow 5-18 m in height, are fire resistant, and are 260 eaten by giraffes and other animals. The leadwood (Combretum 261 imberbe) is also common. It normally grows up to 20 m, has a 262 spreading, rather sparse, roundish to slightly umbrella-shaped 263 crown, and a single thick trunk.

The Skukuza samples shown in Fig. 4(a) were a < 2-mm- 265 diameter fraction of soil and dry leaf litter. The leaf litter is 266



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Fig. 4. (a) Skukuza leaf litter (L) and soil samples (S1) and (S2). (b) Etosha Pan samples EP1, EP2, and EP3. (c) Fresh locust and fresh poplar tree leaves. (d) 2- and 4-mm cut poplar tree leaves.

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267 predominantly from acacia trees and savanna grass. The soil 268 sample S1 is a coarse loamy-sand soil with dominant grass roots 269 from the top of the organic horizon, layer depth of 0–30 cm. The 270 soil sample S2 is an exposed coarse loamy-sand soil from the 271 mineral horizon, layer depth 30–40 cm.

The Etosha Pan [see Fig. 1(b)] is 4590 km<sup>2</sup> in area and 273 120 km  $\times$  72 km in extent situated in northern Namibia. It is 274 desertlike, white in color, and dry salt pan without any vegeta-275 tion. During the rainy season, however, Etosha Pan becomes 276 approximately a 10-cm-deep lake and becomes a breeding 277 ground for thousands of flamingos. Etosha Pan has unique 278 reflective characteristics. Its reflectance spectra are high in the 279 blue, around 440 nm. This explains the apparent white color 280 of the pan as brighter objects in the blue part of the visible 281 spectrum appear whiter to the human eye. The Etosha Pan min-282 eralogy is dominated by four compounds: 1) feldspar and mica; 283 2) feldspar and sepiolite; 3) silicates; and 4) calcite and 284 dolomite, which determine the pan's reflectance spectra. The 285 Etosha Pan surroundings are dominated by mopane and acacia 286 trees and grasslands. We studied four different fractions of 287 Etosha Pan soil sample [see Fig. 4(b)]. The first Etosha sample, 288 named in this paper as "the rock," is a solid piece of pan sedi-289 ment, while the other three samples are regoliths with fractional 290 sizes of 0.5 mm or less for Etosha Pan sample 1, hereinafter 291 EP1, between 1 and 2 mm for EP2, and a submillimeter fraction

In addition to Skukuza and Etosha Pan, samples from 294 Maryland, U.S., consisting of whole, cut and crushed, and fresh 295 and dried locust and poplar tree leaves were studied, as shown 296 in Fig. 4(c) and (d). All samples were air dry at the time of 297 this paper except the fresh locust and poplar samples. The cut 298 and crushed samples were placed in a square  $50 \times 50 \times 5$  mm 299 black plastic holders with the sample surfaces well flattened. 300 Care was taken for uniform particle distribution through the 301 entire surface area. The holders were mounted horizontally on 302 the sample stage and aligned with the scatterometer axes of 303 rotation

The laboratory study of Skukuza samples was done at the 305 same wavelengths and incident and view angles as the CAR 306 instrument airborne measurements over Skukuza. The incident 307 angles for the Skukuza samples were 0° and 67°, the zenith 308 view angles were from 0° to 80° with data acquired in steps 309 of 5°, the azimuthal angles were 0° and 180° corresponding to 310 the principal plane measurement geometry. The measurement 311 wavelengths were 340, 470, and 870 nm, again based on CAR 312 operating wavelengths. The top and bottom of the leaves were 313 measured to account for structural differences such as smooth-314 ness and glossiness.

Similarly, Etosha Pan samples were studied at wavelengths and incident and view angles comparable to the airborne mea-317 surements over Etosha Pan. The Etosha Pan samples were 318 characterized in the DCL at incident angles of 0°, 30°, and 319 60° and zenith view angles from 0° to 80° in steps of 5°. 320 The DCL measurement wavelengths were 412, 555, 667, and 321 869 nm. However, only 667 and 869 nm correspond to the 322 CAR's operational wavelengths.

323 The CAR instrument was flown aboard the University 324 of Washington Convair CV-580 research aircraft during the

Southern Africa Regional Science Initiative 2000 (SAFARI 325 2000) dry-season campaign. The airborne CAR data from a 326 vegetation-rich surface were recorded over Skukuza during the 327 dry season in August 2000 for view angles from  $-80^{\circ}$  to  $80^{\circ}$  328 and at a number of wavelengths. The BRDF of the savanna 329 surface was acquired at  $67^{\circ}$  incident angle and viewing angles 330 from  $-80^{\circ}$  to  $80^{\circ}$  in eight spectral bands from 0.34 to  $1.27~\mu\text{m}$ . 331 A hot spot or retroscatter signal was seen at about  $-70^{\circ}$ . The 332 airborne-computed BRDF shows backscattering properties of 333 the vegetation-covered soil surface.

### IV. RESULTS AND DISCUSSION

## A. Laboratory-Based BRDF of Savanna Samples, Skukuza

The laboratory-based BRDF at normal incidence for the two 337 soils, S1 and S2, and a savanna leaf-litter sample is shown in 338 Fig. 5(a) at 870 nm. The BRDF at 340 and 470 nm is not shown 339 in this paper as the view-angle distribution is similar for those 340 wavelengths. In addition to BRDF measurements, the samples' 341 spectral reflectance was measured with an analytical spectral 342 device (ASD) spectroradiometer in-plane at 0° incident angle 343 and 60° viewing angle from 350 to 2500 nm. The results are 344 compared in Fig. 5(b), where the reflectance spectrum for fresh 345 locust leaf taken at the same measurement geometry is also 346 included. The leaves' complex biochemical composition made 347 up of chlorophyll, pigments, proteins, starches, waxes, water, 348 lignin, and cellulose is apparent in their reflectance spectra. The 349 chlorophyll and pigments influence the spectra in the visible 350 region. The water content and leaf structure contribute to the 351 reflectance in the near-infrared, while the proteins, lignin, and 352 cellulose contribute in the shortwave-infrared [15].

The difference in BRDF of dry and fresh locust and poplar 354 tree leaves at normal incidence is shown in Fig. 6(a) at 340 nm 355 and in Fig. 6(b) at 470 nm. The overall reflectance of the 356 locust dry leaves is higher at all wavelengths. Both fresh and 357 dry poplar leaves have higher BRDF than the locust leaves at 358 smaller scatter zenith angles (i.e.,  $0^{\circ}-30^{\circ}$ ) and lower BRDF at 359 larger scatter zenith angles (i.e.,  $30^{\circ} - 80^{\circ}$ ). The difference in 360 BRDF between the two species illustrates the importance of 361 accurate identification of the types of vegetation in airborne 362 data recording. The percent difference of the BRDF varies 363 between 20% and 60% depending on wavelength. The data 364 at 340 and 470 nm are in the spectral region where mainly 365 pigments dominate the leaf reflectance, whereas the BRDF 366 at 870 nm is affected largely by the water content and leaf 367 structure. For all leaves, there is also a difference in BRDF 368 between the top and bottom sides of the leaves. On average, 369 the bottom BRDF of the locust was always higher than the 370 top BRDF: 34% higher at 340 nm, 48% at 470 nm, and 4% at 371 870 nm, due to the leaves' surface structure.

In order to address the vegetation-canopy remote-sensing 373 scaling problem, we measured the BRDF of cut fresh leaves 374 and crushed dry leaves. The reflectance of a scene as seen from 375 an airborne (or spaceborne) sensor depends on the reflectance 376 of its components and their composition. It was estimated 377 that, for airborne BRDF measurements of land surfaces from a 378 600-m altitude, the average footprint of a 4–5 m in diameter of 379 a typical savanna tree would correspond to a leaf particle size 380

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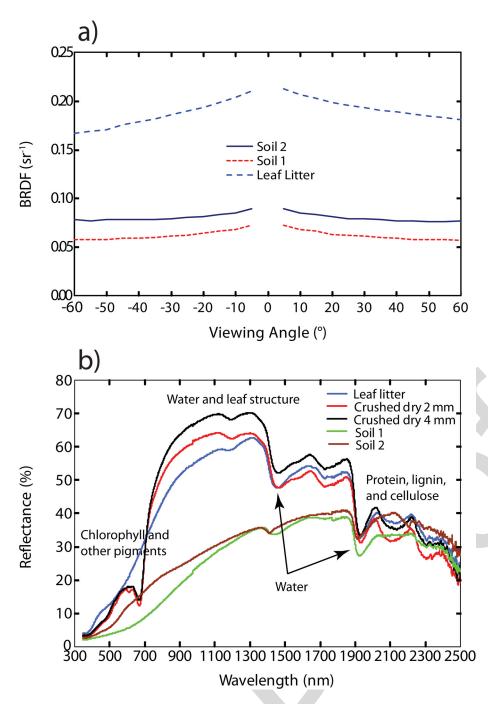


Fig. 5. (a) Laboratory-based BRDF of S1, S2, and L samples at normal incidence and 870 nm. (b) ASD reflectance spectra of S1, S2, and L samples and cut leaves at normal incidence and  $60^{\circ}$  viewing angle.

381 in the laboratory of  $\sim$ 4 mm, whereas the footprint of a typical 382 savanna bush, 1.5–2 m in diameter would correspond to a leaf 383 particle size of  $\sim$ 2 mm. The BRDFs of 2- and 4-mm-size leaves 384 particles (cut fresh, crushed dry) and whole fresh and dry leaves 385 were compared.

The differences in the case of poplar leaves at 340 nm are 387 shown in Fig. 7(a) at normal incidence. Significant differences 388 occur between the measured BRDFs of whole and crushed 389 leaves at small viewing angles from 5° to 45°. The percent 390 differences between the BRDF of whole leaves and crushed 391 leaves having a 4-mm particles size are up to 55% at 5° viewing 392 angle and up to 59% for the 2-mm sample. The differences

at scatter angles from 45° to 80° are on the order of 27% 393 at 80° viewing angle for whole leaves versus 4-mm crushed 394 leaves and 18% for whole leaves versus 2-mm crushed leaves. 395 The possible explanation for this is that the scatter from the 396 whole leaf has a strong specular component, leading to higher 397 reflectance at small scatter angles. The scatter from the crushed 398 leaves is more diffused, resulting in much lower BRDF at 399 small angles. The second reason for the different BRDF is 400 the shadowing effect that takes place when the surface of a 401 sample is not flat but consists of small particles. In the crushed-402 leaf BRDF sample, the scattering between the individual leaf 403 particles is a significant contributor to the reflected distribution 404

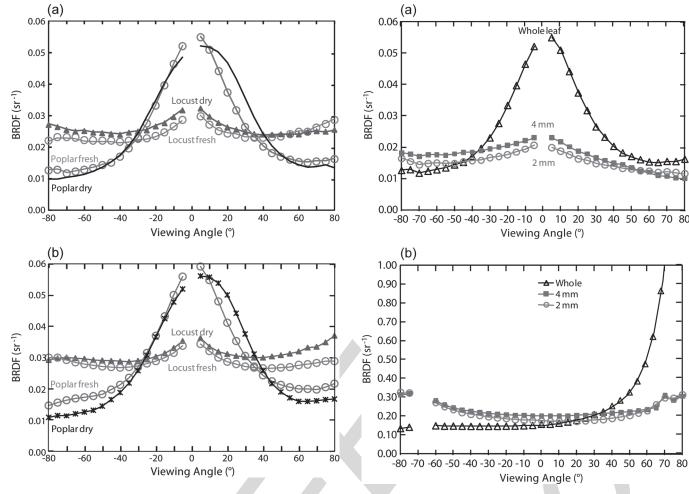


Fig. 6. Laboratory-based BRDF of locust and poplar tree dry and fresh leaves

at normal incidence. (a) 340 nm. (b) 470 nm. 405 of scattered light. The BRDF of the 4-mm sample is higher than

406 the BRDF of the 2-mm sample. The smaller particles exhibit 407 less extensive shadowing when illuminated; however, the light-408 obscuration effect when viewing by the detector is stronger. The difference in the BRDF of 2- and 4-mm samples is relatively 410 small and is not a strong function of increasing scatter angle. We also observed the same BRDF relation at other wavelengths. Whole, 2-, and 4-mm poplar leaves were measured at an 412 413 incident angle of 67°, as shown in Fig. 7(b), which shows data 414 acquired at 870 nm. For non-normal illumination geometries, 415 the leaves exhibit strong forward scattering at all wavelengths 416 for both fresh and dry samples. The backscattering is stronger 417 for the dry samples. The BRDF of fresh and dry poplar leaves at 418 67° incident angle were compared at 340, 470, and 870 nm. The 419 BRDF is lower at shorter wavelengths; however, the scattered-420 light view-angle distribution pattern is largely independent of 421 wavelength. The glossy surface of a whole leaf has a well-422 pronounced specular component, whereas the crushed samples 423 show predominantly diffuse scattering. The shadowing effect of 424 the sample particles is also evident at 67° incident angle.

The soil and leaf-litter samples' BRDF are shown in Fig. 8 at 426 340 and 870 nm. The BRDF distribution depends strongly on 427 the nature of the sample (i.e., soil versus leaf) and the viewing 428 angle. The soil samples, S1 and S2, exhibit enhanced opti-429 cal backscattering. The leaf-litter sample L, however, behaves

Laboratory-based BRDF of whole, 4-, and 2-mm cut poplar leaves at (a) normal incidence and 340 nm and (b)  $67^{\circ}$  incidence and 870 nm.

differently. The L sample exhibits equal forward scattering at 430 340 nm, as shown in Fig. 8(a), and enhanced backscattering 431 at 470 and 870 nm [Fig. 8(b)] (470 nm data not shown). The 432 enhanced backscattering in the L sample is seen to increase 433 with increasing wavelength. Although the BRDF at  $\theta_i = \theta_s$  434 could not be measured due to the relative geometries of the 435 scatterometer source optics and detector, the BRDF for all 436 samples show evidence of a significant opposition effect, which 437 is represented by increased light being retroscattered back in the 438 direction of the incident beam.

In order to compare the laboratory-based BRDF with the 440 airborne measurements, we calculated a composite laboratory- 441 based BRDF from the following laboratory-measured BRDF 442 of four different samples: fresh and dry locust leaves, crushed 443 leaf litter, and soil samples. The ratio of each sample used 444 to produce the composite laboratory-based BRDF was deter- 445 mined by the distribution of the four components as seen 446 by the CAR instrument during its airborne missions. From a 447 careful examination of photographs taken over Skukuza during 448 SAFARI 2000, we estimated that the vegetation cover was 90% 449 (80% fresh, 10% dry), 5% exposed leaf litter, and 5% ex-450 posed soil. The vegetation includes tree canopies as well as 451 savanna grass. The simulated scene BRDF from the fractional 452 laboratory-based BRDF measurements and CAR airborne data 453 are shown in Fig. 9. 454

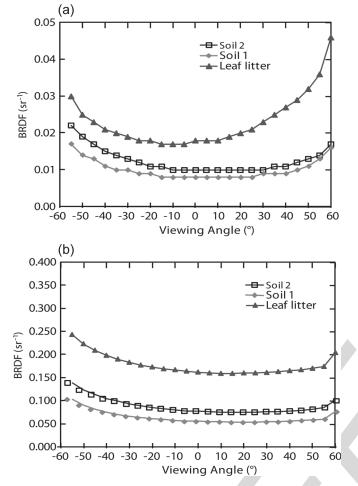


Fig. 8. Laboratory-based BRDF of soil and leaf litter at  $60^\circ$  and (a) 340 and (b) 870 nm.

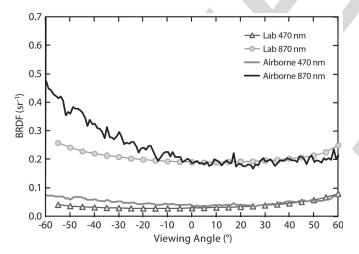


Fig. 9. Simulated-scene BRDF from the fractional laboratory-based BRDF measurements and CAR airborne data at 470 and 870 nm.

455 The same general shape of the BRDF of the laboratory-456 measured samples and airborne measurements can be seen in 457 the data shown in Fig. 9. The BRDF matches very well from 458  $0^{\circ}$  to  $60^{\circ}$  viewing angle at 470 nm and from  $-15^{\circ}$  to  $60^{\circ}$  459 viewing angle at 870 nm. However, there is a significant devi-460 ation between the laboratory and airborne data at increasingly 461 negative scatter angles, corresponding to backscatter directions.

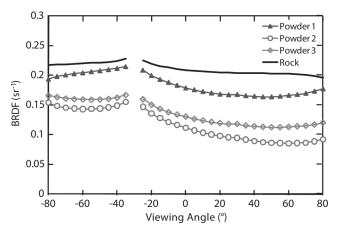


Fig. 10. Laboratory-based BRDF of Etosha Pan samples at  $30^\circ$  incident angle and 667 nm.

The identification of the sources of differences in laboratory and 462 airborne BRDF measurements through quantification of their 463 effects on measured BRDF is an ongoing goal of this paper. 464 For example, we have not accounted for 3-D effects such as 465 tree heights, which would have significant effect on BRDF at 466 a lower sun elevation, particularly in the principal plane at the 467 airborne measurements.

# B. Laboratory-Based BRDF of Salt Pans, Etosha Pan 469

The laboratory-based BRDF at 30° incidence for the four 470 Etosha Pan samples is shown in Fig. 10 at 667 nm. The rock 471 sample's BRDF is higher as the particulate incident light- 472 shadowing and scatter light-obscuration effects are the small- 473 est. The finest structure sample, No.1, has distinctively higher 474 BRDF than the two other larger fractions, samples No. 2 and 3. 475 It is worth noting that the shape of the BRDF curve for the rock 476 sample is different than the shape of the regolith samples. It 477 is also very important that all samples have apparent backscat- 478 tering properties. Although the BRDF at  $\theta_i = \theta_s$  could not be 479 measured due to the relative geometries of the scatterometer 480 source optics and detector, the BRDF for all samples shows evi- 481 dence of a significant opposition effect represented by increased 482 light being retroscattered back in the direction of the incident 483 beam. Sample No. 2, with particle sizes between 1 and 2 mm, 484 has the lowest BRDF. In addition to BRDF measurements, 485 the samples' spectral reflectance was measured with an ASD 486 spectroradiometer in-plane at 30° incident angle and 30° angle 487 from 350 to 2500 nm (see Fig. 11). The ASD reflectance spectra 488 present a full reflectance picture for the VIS-NIR spectral range 489 providing additional information on the Etosha Pan sample's 490 reflectance properties.

In order to correctly compare the laboratory-based BRDF 492 with the airborne measurements, we calculated the composite 493 laboratory-based BRDF from the laboratory-measured BRDF 494 of the three different Etosha Pan samples. The ratio of each 495 sample in the calculated laboratory-based BRDF was deter- 496 mined by the distribution of the three components as seen 497 by the CAR instrument during the airborne measurements. 498 From a careful examination of photographs of Etosha Pan, the 499 components were determined to be 25% EP1, 50% EP2, and 500

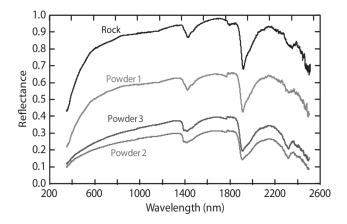


Fig. 11. ASD reflectance of Etosha Pan samples at  $30^\circ$  incident angle and  $30^\circ$  scatter zenith angle.

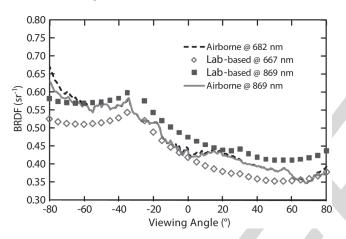


Fig. 12. Etosha Pan simulated-scene BRDF from the fractional laboratory-based BRDF and CAR airborne data.

501 25% EP3. The simulated fractional laboratory-based data are 502 compared to the CAR airborne data in Fig. 12.

The same general shape of the laboratory-measured samples and airborne measurements is shown in Fig. 12. The data match solving within the uncertainty for both wavelengths all over the viewing angular range with the exception of  $-80^{\circ}$ , where the 507 CAR-measured data are slightly higher. However, the airborne data at those two wavelengths are very close. The laboratory-509 based data at 667 and 869 nm show a larger difference than the 510 CAR data at those wavelengths.

# 511 V. CONCLUSION

This paper is intended to describe more completely the 513 BRDF of savanna vegetation and soil samples from Skukuza 514 and soil samples from Etosha Pan measured in a laboratory 515 environment. In addition, the laboratory results are compared to 516 *in situ* measurements of these areas by the CAR instrument. 517 In the laboratory measurements, the BRDF depends on the 518 incident and viewing angles, on the nature of the sample (i.e., 519 crushed versus whole leaf), on the sample status (fresh versus 520 dry), on the sample biochemical composition for Skukuza sam-521 ples, and on the particle size fraction for Etosha Pan samples. 522 The analysis shows strong spectral dependence of the BRDF 523 data on the leaf biochemical composition. The BRDF of the

locust whole leaf bottom was always higher than the BRDF 524 of the top of the same leaf, due to the surface physical struc- 525 ture. The difference in BRDF between the two plant species, 526 locust and tulip poplar, can be as high as 100%, illustrating 527 the importance of knowing the vegetation type for airborne 528 measurements. The difference between the BRDF of whole 529 leaves, 4-, and 2-mm crushed leaves can be as high as 55% at 5° 530 scatter zenith angle due to a strong specular component for the 531 whole leaf sample and the presence of incident light shadowing 532 and scattered light obscuration for the crushed leaves samples. 533 The laboratory-based BRDF of Etosha Pan samples depend on 534 sample fraction. It is highest for the rock sample and lowest for 535 the larger size particles regolith sample.

Laboratory-based and CAR airborne data sets were com- 537 pared at 470 and 870 nm for Skukuza. They matched very well 538 from  $0^{\circ}$  to  $60^{\circ}$  viewing angle at 470 nm and from  $-15^{\circ}$  to 539 60° viewing angle at 870 nm. However, there is a discrepancy 540 between the laboratory and airborne data at negative viewing 541 angles, particularly at higher angles. We examined the dif- 542 ference between the optical scattering properties of fresh and 543 dried vegetation in an effort to identify possible source for 544 this difference. The degree of senescence of vegetation is one 545 potential source for this difference. Laboratory-based and CAR 546 airborne data sets from Etosha Pan were compared at 682 and 547 870 nm for the airborne data and 677 and 869 nm for the 548 laboratory data, respectively. The BRDF curves have the same 549 general shape, and the data matches well into the uncertainty 550 for both wavelengths over all viewing angular range. However, 551 the airborne data show smaller BRDF differences between the 552 two wavelengths than the laboratory-based data. Although the 553 effects of atmospheric absorption and scattering were removed 554 from CAR measurements [8], the process is uncertain consid-555 ering the assumptions made such as aerosol particle shape, 556 which is assumed spherical, and vertical distribution, which 557 is assumed to be homogenously mixed. Note that atmospheric 558 correction is not so important in laboratory measurements. The 559 wavelength difference between airborne and laboratory data is 560 also a source of difference in the BRDF. We believe that the lab- 561 oratory results are of great use to the remote sensing community 562 in their modeling and correction efforts of airborne data.

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